#### Julius-Maximilians-UNIVERSITÄT WÜRZBURG



#### **Common Errors and Assumptions in Energy Measurement and Management**

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#### WU What is this Talk about?

- Measurement methodologies for energy efficiency
  - Focus on server systems
- Some pitfalls: Energy efficiency measurements can be unrepresentative or inaccurate if done incorrectly
- SPEC power methodology [1]: A methodology for standardized energy efficiency benchmarking

 Some results that challenge common implicit assumptions on energy efficiency of servers

### **Energy Efficiency of Servers**

- Relationship of Performance and Power
- For transactional workloads:

$$\frac{transactions}{energy} \begin{bmatrix} \frac{1}{J} \end{bmatrix} = \frac{throughput}{power} \begin{bmatrix} \frac{1}{S} \\ W \end{bmatrix}$$

- Comparison of efficiency of different workload types is difficult
  - Different scales of transaction-counts / throughput
  - → normalization



How to do it wrong...

#### PITFALLS IN POWER MEASUREMENT

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Pitfalls

Methodology

Some Results

Conclusions

## **MUNI Measuring at Maximum Load** (1/2)

A typical server ...

- has an average utilization between 10% and 50%,
- is provisioned with additional capacity (to deal with load spikes).



Energy Efficiency and Power Consumption of Servers [2]

 is not energy efficient at low utilization, more efficient at high utilization

#### Power consumption depends on server utilization.

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#### WU Measuring at Maximum Load (2/2)

Bad Practice for...

- Full system power characterization
- Comparison of server systems intended for transactional workloads (most of them)

Good Practice for...

HPC energy efficiency benchmarking

# WU Varying Loads (1/2)

- Power meters have power measurement ranges
  - Lose measurement accuracy outside of range
  - Switching ranges takes time (~ 1 s)
- Example



### WU Varying Loads (2/2)

Lessons:

- Auto-Ranging is bad for varying loads
  - Lose measurements
- But:
  - Disabling auto-ranging decreases accuracy
- Measurement uncertainty depends on power meter
  - SPEC PTDaemon supported → Less than 1% at optimal range
- Also:
  - Good load calibration is important



How to do it right...

#### SPEC POWER METHODOLOGY

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#### **WU SPEC Power Methodology**

- Methodology for benchmarking of energy efficiency
- Goal:
  - Benchmarking at multiple load levels
  - Taking the quality criteria for benchmarks into account [3]:
    - Relevance
    - Reproducibility
    - Fairness
    - Verifiability
    - Usability
- Used in the following SPEC products:
  - SPECpower\_ssj2008 [4]
  - SPEC SERT [5]
  - ChauffeurWDK
- Other Benchmarks that follow the methodology:
  - SAP Power Benchmark [6]
  - TPC Energy [7]

# wij Load Levels

- Goal: For a given workload, achieve a load level of n% of system "utilization".
- Utilization =  $\frac{t_{busy}}{t_{busy} + t_{idle}}$
- DVFS increases CPU busy time at low load
  - → increases utilization
  - Power over load measurements need to compensate How to compare?
- Our solution: Machine utilization
  - 100% utilization at calibrated maximum throughput

• Load level =  $\frac{current\ throughput}{max.\ throughput}$ 

### **WU** SERT Architecture



Pinned SERT clients

#### **WU SERT Measurement (1/2)**

- Transactional workloads are dispatched in "Intervals":
  - Warmup
  - Calibration
    - Multiple intervals
    - Maximum transaction rate
  - Graduated Measurement Series
    - Multiple intervals at decreasing transaction rate
    - Target transaction rate is percentage of calibration result
    - Exponentially distributed wait times between transactions



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### **SERT Measurement** (2/2)

- Separate measurement intervals at stable states
  - 10 second sleep between intervals
  - 15 second pre-measurement run
  - 15 second post-measurement run
  - 120 second measurement



- Temperature analyzer for comparable ambient temperature
- Power Measurements: AC Wall Power

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#### **WU Performance and Power Variation**

- Throughput results from load level definition
  - Throughput variation is measure of benchmark driver stability
  - Throughput coefficient of variation > 5%  $\rightarrow$  invalid interval

- Power consumption results from SUT response to load
  - Power variation is measure of SUT stability
  - CVs often < 1% on state-of-the-art x86 systems</p>

# WUNI Workloads

- Workloads can be anything, as long as...
- ... they have a measurable throughput
- ... allow for result validation

- Common Workloads:
  - SPEC SERT: "Worklets"
    - 7 CPU Workets
    - 2 HDD Worklets
    - 2 Memory Worklets
    - 1 Hybrid Worklet (SSJ)
  - SPECpower\_ssj2008: Buisiness Transactions
  - TPC Energy
  - ChauffeurWDK: Allows custom workload creation



Motivating future work...

### SOME MEASUREMENT RESULTS

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#### **The Software Stack Matters!** (1/2)

(With differing extent)

- Operating System [8]
  - Impact on base consumption and power scaling behavior



#### **The Software Stack Matters!** (2/2)

(With differing extent)

- JVM [8]
  - Little impact through secondary effects



### **WU** Maximum Energy Efficiency

- Energy Efficiency depends on multiple factors
  - Hardware
  - Software Stack
  - Workload
  - Load Distribution

 Maximum Energy Efficiency is often reached at < 100% load



 Result: Load Consolidation is not most efficient load distribution strategy [9]

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# WU Conclusions

- Power and energy efficiency measurements has many pitfalls
  - Can lead to inaccurate or missing results

- SPEC power methodology is an established standard to avoid errors in energy efficiency benchmarking
  - Goal: Energy efficiency characterization at multiple load levels

 Results demonstrate that energy efficiency and energy efficiency scaling depend on many factors, including hardware, software stack, workload, etc.





# Thanks for listening!

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